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TI-59 PROGRAMS FOR MULTIPLE REGRESSION.(U)  
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TI-59 PROGRAMS FOR  
MULTIPLE REGRESSION

by

D. R. Barr

May 1980

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## **TI-59 PROGRAMS FOR MULTIPLE REGRESSION**

by

D. R. Barr

## 1. Introduction

[Graybill, 1961] can be written as

$$\begin{matrix} \mathbf{y} \\ \mathbf{n} \times 1 \end{matrix} = \begin{matrix} \mathbf{x} \\ \mathbf{n} \times \mathbf{k} \end{matrix} \begin{matrix} \beta \\ \mathbf{k} \times 1 \end{matrix} + \begin{matrix} \epsilon \\ \mathbf{n} \times 1 \end{matrix}, \quad \epsilon \sim N(0, \sigma^2 \mathbf{I}),$$

where  $\mathbf{Y}$  is the vector of  $n$  dependent variable values to be observed,  $\mathbf{X}$  is the "design matrix" of fixed values of the independent variables,  $\beta$  is a vector of unknown fixed coefficients in the model and  $\epsilon$  is the unobservable random error vector.

The  $i^{\text{th}}$  row in this matrix equation,

$$Y_i = x_{0i}\beta_0 + \beta_1 x_{1i} + \cdots + \beta_k x_{ki} + \varepsilon_i,$$

represents the  $i^{\text{th}}$  dependent value to be observed as a linear function of the  $i^{\text{th}}$  set of independent variable values:

$$x_{0i}, x_{1i}, \dots, x_{ki}.$$

The solution to the normal equations for estimating  $\beta$ ,

$$(x'x)\hat{\beta} = x'y ,$$

where  $y$  is the  $n \times 1$  vector of observed outcomes on  $Y$ , can be found using program 02 in the TI-59 master module, provided  $x'x$  is of full rank  $k$  and  $1 < k < 9$ . Due to space requirements for computing  $x'x$ , the program presented here requires  $k < 8$ . Also, because of optional programs (which run faster) for  $k = 2$  (OP12-OP15 and  $\Sigma+$ ) and  $k = 3$  (statistics module program 18), the programs presented here are most useful for  $3 < k < 8$ . There is no limit on the number of observations,  $n$ . Tests of hypotheses about components of  $\beta$  can be carried out using a "reduced model" solution, and confidence intervals for linear functions of the coefficients can be obtained using  $(x'x)^{-1}$  and  $\hat{\sigma}^2$ , based on the t-distribution, as outlined in [1]. Tests and confidence intervals for  $\sigma^2$  can be obtained from  $\hat{\sigma}^2$ , based on the  $\chi^2$  distribution.

## 2. The Programs

Listings of two programs are given in the appendix.

Program #1 serves two purposes:

- (a) computation of  $x'x$ ,  $x'y$  and  $y'y$  as rows of the data matrix  $(x : y)$  are entered;
- (b) computation of  $\hat{\beta}$ ,  $\hat{\beta}'x'y$  and  $(x'x)^{-1}$  for the full model.

Program #2 also serves two purposes:

- (a) computation of reduced model components  $(x'x)_r$  and  $(x'y)_r$ , and loading them into memory;
- (b) computation of  $\hat{\beta}'_r(x'y)_r$  for the reduced model.

A multiple regression problem is solved with these programs following the sequence:

- (a) load Program #1 (2 banks)
- (b) enter rows of the data matrix
- (c) store  $x'x$  and  $x'y$  on cards
- (d) compute and record  $\hat{\beta}$ ,  $\hat{\beta}'x'y$ ,  $(x'x)^{-1}$ ,  $y'y$  and  $x'y$
- (e) load Program #2 (1 bank), along with the stored data
- (f) compute  $\hat{\beta}'_r(x'y)_r$  for the reduced model.

Steps (c), (e) and (f) are optional, depending on whether it is desired to test hypotheses that various components of  $\beta$  are zero. Components of  $\hat{\beta}$  and  $(x'x)^{-1}$  can be recalled from memory (or listed on the printer using the "INV LIST" command) as desired.

Entering each row of the data matrix and updating  $x'x$ ,  $x'y$  and  $y'y$  requires from 30-60 seconds, depending on  $k$ . Computation of  $\hat{\beta}$  and  $(x'x)^{-1}$  requires from 1 minute to 12 minutes, again depending on the dimension of  $x'x$ . In what follows, we give instructions for using the programs in the TI program record format. This is followed by an annotated example printer output (use of the printer is optional). Program listings are given in the Appendix.

### 3. Instructions

Instructions for running the programs are given in Figures 1 and 2. Using the quantities computed when both programs are used, an "analysis of variance" summary can be constructed. The format of this table, and sources of its entries, are given below, in Figure 3. An hypothesis of the form  $H_0: \beta_i = 0$  is tested with the F ratio with the " $\hat{\beta}_i$  sum of squares" in the numerator and the "error mean square"

$$\hat{\sigma}^2 = \frac{\hat{y}'\hat{y} - \hat{\beta}'\hat{x}'\hat{y}}{n - k}$$

in the denominator. Degrees of freedom for this F ratio would be 1 and  $n-k$ . Note that the sum of squares due to regression in the full model,  $\hat{\beta}'\hat{x}'\hat{y}$ , generally is not partitioned into independent components due to  $\beta_0, \beta_1, \dots, \beta_k$  unless the design is "orthogonal" ( $\hat{x}'\hat{x}$  is diagonal). Thus, tests of several hypotheses about components of  $\beta$  are generally not statistically independent. See [Searle, 1972] for a discussion of how to proceed if it is desired to test several hypotheses in the non-orthogonal case.

If one wishes to compute the coefficient of determination  $R^2$  (which is not as useful as the related F-ratio), proceed as follows. First, compute the "adjusted total sum of squares,"  $SST_{(adj)} = y'y - (\sum y_i)^2/n$ , where  $y'y$  is stored in register 78,  $\sum y_i$  in register 71\* and  $n$  in register 08 at the first step of Program 1. Then

\*See Comment in Figure 3.

TITLE MULTIPLE REGRESSION--PGM #1 PAGE 1 OF 1PROGRAMMER BARR DATE 4/1/80Partitioning (Op 17) S.T.D. Library Module MASTER Printer OPTIONAL Cards 1  
(Banks 1,2)TI Programmable  
Program Record

## PROGRAM DESCRIPTION

For the general linear hypothesis model  $Y = XB + c$ , calculates:  $x'x$ ,  $x'y$ ,  $y'y$ ,  $|x'x|$ ,  $(x'x)^{-1}$ ,  $\hat{B}$ ,  $\hat{B}'x'y$ ,  $Ey_i$ . Program can handle up to 7 independent variables. Running time increases as the dimension  $k$  of  $x'x$  increases. Any number  $n$  of data points can be accommodated.

## USER INSTRUCTIONS

STEP	PROCEDURE	ENTER	PRESS	DISPLAY
1	Initialize	k	E	1
2	Enter rows of $(x : y)$	$x_{11} \rightarrow R/S; x_{12} \rightarrow R/S; \dots; x_{in} \rightarrow R/S; y_1 \rightarrow R/S$	B	next row index
	(repeat above sequence until all rows entered).*			
3	Display $x'x$ , $x'y$ , $y'y$ , $Ey_i$ (or use "INV LIST" with printer) $\#08 - (07 + k^2)$ : columns of $x'x$ (note: #08 is n) $\#71 - (70 + k)$ : $x'y$ . (NOTE: #71 is $Ey_i$ ). $\#78: y'y$ Note: save $x'x$ and $x'y$ on cards if "reduced model" is desired (banks 2,3,4)			
4	Compute $\hat{B}$ (with printer, $ x'x $ is printed)		C	1
5	Display $\hat{B}$ , $\hat{B}'x'y$ , $(x'x)^{-1}$ : Recall (or use "INV LIST" w/printer) $\#08 - (07 + k^2)$ : Columns of $(x'x)^{-1}$ in permuted order--order of permutation stored in $\#(08 + k^2) - (07 + k^2 + k)$ $(\#08 + k^2 + k) - (07 + k^2 + 2k)$ : $\hat{B}$ $\#71 - (70 + k)$ : $x'y$ $\#79: \hat{B}'x'y$			

USER DEFINED KEYS	DATA REGISTERS (Op 08) (see listing)	LABELS (Op 08) (see listing)
A	0	0
B x'x update	1 ALL USED;	1 INTERNAL
C $\hat{B}$ computation	2 PARTITIONING	T0 319.79
D Initialize	3	3
E	4	4
F	5	5
G	6	6
H	If an error in entry is made, press ".SBR 015" and re-enter the data row. This must be done before pressing "B".	7
I	7	7
J	8	8
K	9	9
L	0	0
M	1	1
N	2	2
O	3	3
P	4	4
Q	5	5
R	6	6
S	7	7
T	8	8
U	9	9
V	0	0
W	1	1
X	2	2
Y	3	3
Z	4	4
0	5	5
1	6	6
2	7	7
3	8	8
4	9	9
5	0	0
6	1	1
7	2	2
8	3	3
9	4	4
0	5	5
1	6	6
2	7	7
3	8	8
4	9	9
5	0	0
6	1	1
7	2	2
8	3	3
9	4	4
0	5	5
1	6	6
2	7	7
3	8	8
4	9	9
5	0	0
6	1	1
7	2	2
8	3	3
9	4	4
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5	0	0
6	1	1
7	2	2
8	3	3
9	4	4
0	5	5
1	6	6
2	7	7
3	8	8
4	9	9
5	0	0
6	1	1

TITLE MULTIPLE REGRESSION--PGM #2 PAGE 1 OF 1PROGRAMMER BARR DATE 4/1/80Partitioning (Op 17) 3,1,9,7,9 Library Module MASTER Printer OPTIONAL Cards 1  
(Bank 1)

# TI Programmable Program Record

**PROGRAM DESCRIPTION**

For use with multiple regression program #1 to compute the reduced model components  $(x'x)_r$  and  $(x'y)_r$ , and to compute the sum of squares due to regression in the reduced model,  $\hat{\beta}_r'(x'y)_r$ .

**USER INSTRUCTIONS**

STEP	PROCEDURE	ENTER	PRESS	DISPLAY
1	Enter full data $(x'x, x'y)$ into Banks 2, 3, 4.			
2	Load PGM #2 into Bank 1.		A	0
3	Enter variable to be omitted (Repeat if several variables to be omitted— omit in decreasing order of subscripts)		B	$\hat{\beta}_r'(x'y)_r$
4	Compute $\hat{\beta}_r'(x'y)_r$			

USER DEFINED KEYS	DATA REGISTERS (INV Inv)			LABELS (Op 08) (see listing)							
A Omit variables	0	00-79 used	,	INV	[Inv]	[CE]	[CLR]	[x <sup>y</sup> ]	[x <sup>2</sup> ]		
B Compute $\hat{\beta}_r'(x'y)_r$	1				[ $\sqrt{x}$ ]	[ $\sqrt{y}$ ]	[STO]	[RCL]	[SUM]	[ $\Sigma^2$ ]	
C	2				[EE]	[ $\times 10^n$ ]	[ $\pm$ ]	[ $\div$ ]	[ $\times$ ]	[ $\times$ ]	[GTO]
D	3				[SDR]	[ $\bar{x}$ ]	[RST]	[ $\bar{y}$ ]	[ $\bar{x}\bar{y}$ ]	[ $\bar{x}^2$ ]	[ $\bar{y}^2$ ]
E	4				[ $\frac{d}{dx}$ ]	[ $\int_0^x$ ]	[CLR]	[INV]	[ $\frac{dy}{dx}$ ]	[ $\frac{d^2y}{dx^2}$ ]	
F	5				[ $\frac{dy}{dx}$ ]	[ $\int_0^x$ ]	[ $\bar{x}-1$ ]	[ $\bar{y}-1$ ]	[ $\bar{x}$ ]	[ $\bar{y}$ ]	
G	6				[ $\bar{x}$ ]	[ $\bar{y}$ ]	[ $x-1$ ]	[ $y-1$ ]	[ $x$ ]	[ $y$ ]	
H	7				[ $x$ ]	[ $y$ ]	[ $x^2$ ]	[ $y^2$ ]	[ $x^3$ ]	[ $y^3$ ]	
I	8				[ $x^4$ ]	[ $y^4$ ]	[ $x^5$ ]	[ $y^5$ ]	[ $x^6$ ]	[ $y^6$ ]	
J	9				[ $x^7$ ]	[ $y^7$ ]	[ $x^8$ ]	[ $y^8$ ]	[ $x^9$ ]	[ $y^9$ ]	
FLAGS	0	1	2	5	6	7	8	9			

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FIGURE 2

Index	Source	Degrees of Freedom	Sums of Squares
1.	Regression (full)	k	$\hat{\beta}'x'y$ (Pgm 1)
$2_0$ .	$\beta_0$	1	$\hat{\beta}'x'y - \hat{\beta}'_r(x'y)_r$ (Pgms 1 & 2)
$2_1$ .	$\beta_1$	1	
:	:	:	
3.	Mean	1	$\bar{y}^2$ (from $\sum Y_i$ in first component of $x'y$ , Pg 1)*
4.	Error	$n-k$	$y'y - \hat{\beta}'x'y$ (Pgm 1)
5.	Total	n	$y'y$

FIGURE 3. AOV Summary

\* Provided the first column of  $X$  is a vector of 1's.

$$R^2 = \frac{SST_{(adj)} - SSE}{SST_{(adj)}},$$

where the sum of squares due to error is given by

$$SSE = \hat{y}'y - \hat{\beta}'x'y = (n-k)\hat{\sigma}^2.$$

4. Example. ( $k = 3$  example from the TI "Applied Statistics" module booklet; page 5-15)

- (1) Read in Program #1, banks 1 and 2,
- (2) enter "3", press E,
- (3) enter first row of  $(x : y)$ , as follows (do not forget the "1" corresponding to the constant term):

1/ R/S, 0, R/S, 0, R/S, 17.3, R/S, B (next row index displays),

(repeat this sequence, entering 9 rows of data as in Table 5.2, which we produce in Table 1 for convenience.

row number	$a_0$	$a_1$	$a_2$	dependent variable
1	1	0	0	17.3
2	1	0	1	18.1
3	1	0	2	18.7
4	1	1	0	18.6
5	1	1	1	19.1
6	1	1	2	19.5
7	1	2	0	19.6
8	1	2	1	19.9
9	1	2	2	20.3

Table 1

- (4) write banks 2, 3, 4 to save  $x'x$ ,  $x'y$  if tests of hypotheses about coefficients are desired (see listings below). Save  $y'y$  (register 78) and  $\Sigma y_i$  (register 71),
- (5) press C to compute  $\hat{\beta}$ ,  $\hat{\beta}'x'y$ ,  $(x'x)^{-1}$ ,
- (6) recall and note desired components, as follows (see listing below)
  - a) columns of  $(x'x)^{-1}$  in registers 08 to 16, order of columns permuted; permutation stored in 17, 18, 19
  - b)  $\hat{\beta}$  in registers 20, 21, 22
  - c)  $x'y$  in registers 71, 72, 73
  - d)  $y'y$  (total sum of squares) in register 78
  - e)  $\beta'x'y$  (sum of squares due to regression) in register 79.
- (7) To test  $H_0: a_0 = 0$  (for example) reduce model to eliminate the first independent variable as follows:
  - a) read in data (stored at step 2) in banks 2, 3, 4
  - b) read in Program #2, bank 1
  - c) enter the variable to be deleted ("1" in this case),  
press A
  - d) when computation is complete, Press B to compute the reduced sum of squares due to regression
  - e) when computation is complete, the sum of squares due to regression in the reduced model  $\hat{\beta}_r'(x'y)_r$  (where "r" means "reduced"), is displayed and is stored in register 79.

f) The F-ratio for testing  $H_0: a_0 = 0$  is formed as follows:

$$\frac{\hat{\beta}'x'y - \hat{\beta}'_r(x'y)_r}{(y'y - \hat{\beta}'x'y)/(n-k)} = 2705.2$$

degrees of freedom are 1 and  $(n-k) = 6$ .

(7') If it is desired to test other hypotheses of the form

$H_0: a_i = 0$ , repeat the steps in (7) above, with appropriate entry of "i" at step (7c). (Step (7b) need not be repeated.)

(7") It is desired to test a hypothesis that several coefficients are jointly zero,  $H_0: a_i = a_j = \dots = a_m = 0$ , repeat step (7c) for each variable to be deleted, in descending order of magnitude of the subscripts. In this case, the F-ratio shown in (7f) should be divided by the number (say s) of remaining variables, and the F statistic has s and  $n-k$  degrees of freedom.

(8) Values obtained for the example and the hypothesis illustrated in step (7) are shown on the attached printouts. A summary AOV table is shown in Table 2.

Source	df	SS	F
Regression: full	3	3259.7161	
reduced	<u>2</u>	<u>2565.8327</u>	$\frac{693.88}{.1539/6} = 27$
due to $a_0$	1	693.8834	
Total	9	3259.87	
Error	6	(3259.87-3259.7161)=.1539	$\hat{\sigma}^2 = .1539/6$

Table 2. Summary AOV for example.

EXAMPLE RESULTS

At Step 4

	57.	00
	10.	01
	0.	02
	3.	03
	3.	04
	73.	05
	60.	06
	3.	07
k		
n	9.	08
	9.	09
	9.	10
	9.	11
x'x	15.	12
	9.	13
	9.	14
	9.	15
	15.	16
	0.	17
	0.	18
	0.	19

	0.	70
$\Sigma y_i$	171.1	71
$x'y$	176.8	72
	174.1	73
	0.	74
	0.	75
	0.	76
	0.	77
yy'	3259.87	78
	0.	79

|x'x|

324.

9.	00
16.	01
16.	02
19.	03
3.	04
4.	05
324.	06
3.	07

- .1666666667	08
- 7. -13	09
- .1666666667	10
- .1666666667	11
- .1666666667	12
0.	13
. 4444444444	14
- .1666666667	15
- .1666666667	16

Step 5 }

Permutation

3.	17
2.	18
1.	19
17. 56111111	20
8	0.95
	0.5
0.	23
0.	24
0.	25

0.	70
171. 1	71
176. 8	72
174. 1	73

0.	74
0.	75
0.	76
0.	77
3259. 87	78
3259. 716111	79

	9.	00
	16.	01
	0.	02
	0.	03
	73.	04
	74.	05
	1.	06
	2.	07
reduced	15.	08
x'x	9.	09
(omit $a_0$ )	9.	10
	15.	11
	9.	12
	9.	13
	15.	14
	0.	15
	15.	16
	0.	17
	0.	18
	0.	19
	0.	20

Step 7c-7e:

{  
 (enter "1",  
 press "A")

	0.	70
reduced	176.8	71
x'y	174.1	72
	174.1	73
	0.	74
	0.	75
	0.	76
	0.	77
y'y	3259.87	78
	0.	79

(Press "B")

|x'x<sub>r</sub>| 144.

$\hat{\beta}_r'(x'y)_r$  2565.832708

(displayed and stored in 79)

## APPENDIX 1

### PROGRAM LISTINGS

Note: Program #1 is recorded with standard partitioning; when run it internally partitions the calculator to 319.79. Program #2 and data cards storing  $x^x$  and  $x^y$  (if written) are written with 319.79 partitioning.

If it is desired to write Program #1 after it has been run, repartition back to standard format prior to writing (enter 6, press "2<sup>nd</sup> OP 17").

## PROGRAM 1

### LABEL ADDRESSES

001	15	E
009	18	C'
025	11	R
034	12	B
044	17	B'
104	16	R'
134	13	C
149	33	X <sup>2</sup>
157	34	FX
178	35	1/X
217	23	LNX
226	24	CE

### MULTIPLE REGRESSION

#### PROGRAM 1

000	76	LBL	026	72	ST*	052	05	05
001	15	E	027	00	00	053	05	5
002	47	CMS	028	69	DP	054	07	7
003	42	STD	029	20	20	055	85	+
004	07	07	030	91	R/S	056	43	RCL
005	08	8	031	61	GTO	057	04	04
006	69	DP	032	11	R	058	54	)
007	17	17	033	76	LBL	059	42	STD
008	76	LBL	034	12	B	060	06	06
009	18	C'	035	22	INV	061	73	RCL
010	73	RCL	036	86	STF	062	05	05
011	06	06	037	01	01	063	65	X
012	33	X <sup>2</sup>	038	00	0	064	73	RCL
013	44	SUM	039	42	STD	065	06	06
014	78	78	040	03	03	066	54	)
015	05	5	041	42	STD	067	32	XJT
016	07	7	042	04	04	068	87	IFF
017	42	STD	043	76	LBL	069	01	01
018	00	00	044	17	B'	070	16	R'
019	69	DP	045	05	5	071	08	8
020	21	21	046	07	7	072	85	+
021	43	RCL	047	85	+	073	43	RCL
022	01	01	048	43	RCL	074	04	04
023	91	R/S	049	03	03	075	85	+
024	76	LBL	050	54	)	076	53	(
025	11	R	051	42	STD	077	43	RCL

078	07	07	128	22	INV
079	65	X	129	86	STF
080	43	RCL	130	01	01
081	03	03	131	61	GTO
082	54	)	132	17	B'
083	54	)	133	76	LBL
084	42	STO	134	13	C
085	05	05	135	43	RCL
086	32	XIT	136	01	01
087	74	SM*	137	75	-
088	05	05	138	01	1
089	69	DP	139	54	)
090	24	24	140	42	STO
091	43	RCL	141	00	.00
092	07	07	142	36	PGM
093	32	XIT	143	02	02
094	43	RCL	144	13	C
095	04	04	145	01	1
096	22	INV	146	42	STO
097	77	GE	147	03	03
098	17	B'	148	76	LBL
099	86	STF	149	33	X <sup>2</sup>
100	01	01	150	43	RCL
101	61	GTO	151	03	03
102	17	B'	152	32	XIT
103	76	LBL	153	00	0
104	16	A'	154	42	STO
105	07	7	155	04	04
106	01	1	156	76	LBL
107	85	+	157	34	FX
108	43	RCL	158	43	RCL
109	03	03	159	07	07
110	54	)	160	33	X <sup>2</sup>
111	42	STO	161	85	+
112	05	05	162	08	8
113	32	XIT	163	85	+
114	74	SM*	164	43	RCL
115	05	05	165	04	04
116	69	DP	166	54	)
117	23	23	167	42	STO
118	43	RCL	168	02	02
119	07	07	169	73	RCL
120	32	XIT	170	02	02
121	43	RCL	171	67	E0
122	03	03	172	35	1/X
123	67	E0	173	69	DP
124	18	C'	174	24	24
125	00	0	175	61	GTO
126	42	STO	176	34	FX
127	04	04	177	76	LBL

178	35	1/X	227	08	8
179	07	7	228	85	+
180	00	0	229	43	RCL
181	85	+	230	07	07
182	43	RCL	231	33	X <sup>2</sup>
183	03	03	232	85	+
184	54	)	233	43	RCL
185	42	STD	234	07	07
186	02	02	235	85	+
187	08	8	236	43	RCL
188	85	+	237	01	01
189	43	RCL	238	54	)
190	07	07	239	42	STD
191	85	+	240	02	02
192	43	RCL	241	07	7
193	07	07	242	01	1
194	33	X <sup>2</sup>	243	85	+
195	85	+	244	43	RCL
196	43	RCL	245	01	01
197	04	04	246	54	)
198	54	)	247	42	STD
199	42	STD	248	05	05
200	05	05	249	73	RC*
201	73	RC*	250	02	02
202	02	02	251	65	X
203	72	ST*	252	73	RC*
204	05	05	253	05	05
205	43	RCL	254	54	)
206	07	07	255	44	SUM
207	32	X <sup>1/2</sup> T	256	79	79
208	43	RCL	257	69	DP
209	03	03	258	21	21
210	67	EQ	259	43	RCL
211	23	LNX	260	07	07
212	69	DP	261	32	X <sup>1/2</sup> T
213	23	23	262	43	RCL
214	61	GTO	263	01	01
215	33	X <sup>2</sup>	264	22	INV
216	76	LBL	265	77	GE
217	23	LNX	266	24	CE
218	25	CLR	267	25	CLR
219	36	PGM	268	36	PGM
220	02	02	269	02	02
221	15	E	270	17	B*
222	00	0	271	91	R/S
223	42	STD	272	00	0
224	01	01	273	00	0
225	76	LBL	274	00	0
226	24	CE	275	00	0

PROGRAM 2

LABEL ADDRESSES

032	11	A
072	17	B'
114	12	B
147	18	C'
178	19	D'

MULTIPLE REGRESSION

PROGRAM 2

000	76	LBL	030	92	RTN	060	01	1
001	16	A'	031	76	LBL	061	54	)
002	73	RC*	032	11	A	062	42	STD
003	05	05	033	42	STD	063	04	04
004	72	ST*	034	06	06	064	43	RCL
005	04	04	035	65	X	065	07	07
006	69	DP	036	43	RCL	066	75	-
007	25	25	037	07	07	067	02	2
008	69	DP	038	54	)	068	54	)
009	24	24	039	85	+	069	42	STD
010	97	DSZ	040	08	8	070	02	02
011	03	03	041	54	)	071	76	LBL
012	16	A'	042	42	STD	072	17	B'
013	92	RTN	043	05	05	073	43	RCL
014	76	LBL	044	75	-	074	07	07
015	10	E'	045	43	RCL	075	75	-
016	43	RCL	046	07	07	076	01	1
017	07	07	047	54	)	077	54	)
018	75	-	048	42	STD	078	42	STD
019	43	RCL	049	04	04	079	03	03
020	06	06	050	71	SBR	080	71	SBR
021	54	)	051	10	E'	081	16	A'
022	65	X	052	08	8	082	69	DP
023	43	RCL	053	85	+	083	25	25
024	07	07	054	43	RCL	084	69	DP
025	54	)	055	06	06	085	32	32
026	42	STD	056	54	)	086	43	RCL
027	03	03	057	42	STD	087	02	02
028	71	SBR	058	05	05	088	32	XIT
029	16	A'	059	75	-	089	00	0

090	22	INV						
091	77	GE	125	79	79			
092	17	B*	126	36	PGM	160	00	00
093	71	SBR	127	02	02	161	18	C*
094	10	E*	128	13	C	162	69	DP
095	07	7	129	43	RCL	163	21	21
096	01	1	130	07	07	164	25	CLR
097	85	+	131	42	STO	165	36	PGM
098	43	RCL	132	00	00	166	02	02
099	06	06	133	43	RCL	167	15	E
100	54	)	134	03	03	168	07	7
101	42	STO	135	85	+	169	01	1
102	05	05	136	43	RCL	170	42	STO
103	75	-	137	07	07	171	02	02
104	01	1	138	54	)	172	76	LBL
105	54	)	139	42	STO	173	19	D*
106	42	STO	140	01	01	174	73	RC*
107	04	04	141	76	LBL	175	01	01
108	43	RCL	142	18	C*	176	65	x
109	07	07	143	73	RC*	177	73	RC*
110	75	-	144	03	03	178	02	02
111	43	RCL	145	85	+	179	54	)
112	06	06	146	07	7	180	44	SUM
113	54	)	147	00	0	181	79	79
114	42	STO	148	54	)	182	69	DP
115	03	03	149	42	STO	183	21	21
116	71	SBR	150	04	04	184	69	DP
117	16	A*	151	73	RC*	185	22	22
118	69	DP	152	04	04	186	97	DSZ
119	37	37	153	72	ST*	187	07	07
120	91	R/S	154	01	01	188	19	D*
121	76	LBL	155	69	DP	189	43	RCL
122	12	B	156	33	33	190	79	79
123	00	0	157	69	DP	191	91	R/S
124	42	STO	158	31	31	192	00	0
			159	97	DSZ	193	00	0
						194	00	0
						195	00	0

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5. References

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